### Data process (code from A1)

```
import pandas
import numpy as np
import matplotlib.pyplot as plt

import torch
import torch.nn as nn
import torch.optim as optim

from nltk.stem import PorterStemmer
import nltk
nltk.download("stopwords")
from nltk.corpus import stopwords
```

## Download data to txt file

```
import os
# plz edit path
file path = "/Users/wangzeyang/Desktop/CSC413/A2/aclImdb/test/neg"
file path pos = "/Users/wangzeyang/Desktop/CSC413/A2/aclImdb/test/pos"
lst = os.listdir(file path)
lst 2 = os.listdir(file path pos)
print(lst 2)
new_file = open("valid_data.txt", "w+")
for file name in lst:
    read file = open(file path + "/" + file name, "r+")
    new file.write(file name[-5] + " ")
    content = read file.read(1600)
    new file.write(content)
    new file.write("\n")
    read file.close()
for file name in lst 2:
    read file = open(file path pos + "/" + file name, "r+")
    new_file.write(file_name[-5] + " ")
    content = read file.read(1600)
    new file.write(content)
    new file.write("\n")
    read file.close()
new file.close()
```

```
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                                                                                  X
iite path = "/Users/wang/eyang/pesktop/csc413/AZ/actimop/train/neg
file_path_pos = "/Users/wangzeyang/Desktop/CSC413/A2/aclImdb/train/pos"
lst = os.listdir(file path)
lst 2 = os.listdir(file path pos)
print(lst 2)
new file = open("train data.txt", "w+")
for file name in lst:
    read file = open(file path + "/" + file name, "r+")
    new file.write(file name[-5] + " ")
    content = read file.read(1600)
    new file.write(content)
    new file.write("\n")
    read file.close()
for file name in lst 2:
    read file = open(file path pos + "/" + file name, "r+")
    new file.write(file name[-5] + " ")
    content = read file.read(1600)
    new file.write(content)
    new file.write("\n")
    read file.close()
new file.close()
Read data to colab
# upload dataset
from google.colab import drive
drive.mount('/content/gdrive')
train path = '/content/qdrive/My Drive/CSC413/train data.txt'
valid path = '/content/gdrive/My Drive/CSC413/valid data.txt'
```

# ᆾ Part 1 Data anlyze

1-a: Functions for data analyze.

```
import string
import collections
def get_score(path):
```

```
data = []
    for line in open(path):
        score = int(line.replace("<br />", "").split()[0])
        data.append(score or 10)
    return data
def read sentences1(path, max word):
    data = []
    punct = string.punctuation
    for line in open(path):
        # replace <br/> and punctuations
        line 1 = line.replace("<br />", "")
        # remove punctuations
        for i in line 1:
            if i in punct:
                line_1 = line_1.replace(i, " ")
        words 1 = line 1.split()
        words = [word for word in words_1 if len(word) > 3]
        # set maximum length for each sentence and pad with <EOS>
        if len(words) > max word:
            sentence = [word.lower() for word in words[0 : max word]]
        else:
            sentence = [word.lower() for word in words[0:]]
        data.append(sentence)
    return data
def read sentences2(path, max word):
    data = []
    punct = string.punctuation
    stopWords = stopwords.words("english")
    stemmer = PorterStemmer()
    for line in open(path):
        # replace <br/> and punctuations
        line 1 = line.replace("<br />", "")
        # remove punctuations
        for i in line 1:
            if i in punct:
                line_1 = line_1.replace(i, " ")
        words 1 = line 1.split()
        # remove stop words
        words = [word for word in words 1 if len(word) > 3 and word not in stopWord
        for i in range(len(words)):
            words[i] = stemmer.stem(words[i])
        for word in words:
            for l in range(len(word) - 2):
```

```
if word[l] == word[l + 1] == word[l + 2]:
                    words.remove(word)
                    break
        for word in words:
            for l in word:
                if l.isdigit():
                    words.remove(word)
                    break
        if len(words) > max word:
            sentence = [word.lower() for word in words[0 : max word]]
        else:
            sentence = [word.lower() for word in words[0:]]
        data.append(sentence)
    return data
def word anaylze(data):
    all words = [word for sentence in data for word in sentence]
    word_counts = collections.Counter(all_words)
    print('Most common 10 words:')
    print(word counts.most common(10))
    vocabulary_size = len(word_counts)
    print("size of vocab: ", vocabulary size)
    sentence lengths = [len(sentence) for sentence in data]
    sentence length counts = collections.Counter(sentence lengths)
    print("sentence length: ", sentence length counts)
    return
1-b. Analyze the score part
import statistics
score_data = get_score(train_path)
print("total number of scores:", len(score data))
occur counts = []
for i in set(score data):
    occur counts.append(count:= score data.count(i))
    print(i, "occurrence count: ", count)
print("negative sum: ", sum(occur_counts[:4]))
print("positive sum: ". sum(occur counts[4:1))
```

```
print("mean: ", statistics.mean(score_data))
print("median: ", statistics.median(score_data))
print("most occurrence number: ", statistics.mode(score_data))

1-c. Analyze the word part

max_word = 100
words_data = read_sentences1(train_path, max_word)
words_data2 = read_sentences2(train_path, max_word)

print('before remove stop words: ')
word_anaylze(words_data)
print('after remove stop words: ')
word_anaylze(words_data2)
```

# Part 2 Data processing

```
import string
def read sentences(path, max word):
    data = []
    punct = string.punctuation
    stopWords = stopwords.words("english")
    stemmer = PorterStemmer()
    for line in open(path):
        # replace <br/> and punctuations
        line 1 = line.replace("<br />", "")
        # remove punctuations
        for i in line 1:
            if i in punct:
                line 1 = line 1.replace(i, " ")
        words 1 = line 1.split()
        # remove stop words
        words = [word for word in words 1 if len(word) > 4 and word not in stopWord
        # reduce to root
        for i in range(len(words)):
            words[i] = stemmer.stem(words[i])
        # remove incorrect spelling words (words with 3 same letters)
        for word in words:
            for l in range(len(word) - 2):
```

```
if word[l] == word[l + 1] == word[l + 2]:
                    words.remove(word)
                    break
        # remove digits
        for word in words:
            for l in word:
                if l.isdigit():
                    words.remove(word)
                    break
        # set maximum length for each sentence and pad with empty string
        if len(words) > max word:
            sentence = [words 1[0], [word.lower() for word in words[0 : max word]]]
        else:
            sent = [word.lower() for word in words[0:]]
            for i in range(len(words), max word):
                sent.append("")
            sentence = [words 1[0], sent]
        data.append(sentence)
    return data
# read sentences and vocab
max word = 100
train data 1 = np.array(read sentences(train path, max word))
valid data 1 = np.array(read sentences(valid path, max word))
print(len(train data 1))
vocab = set([w for s in train data 1 for w in s[1]])
vocab size = len(vocab)
print(vocab size) # 41456
# split validation and test set 50%
splt 1 = 0
splt 2 = 12500
np.random.shuffle(valid data 1)
np.random.shuffle(train data 1)
train data = np.concatenate((train data 1, valid data 1[0:splt 1]), axis=0)
valid data = valid data 1[splt 1:splt 1 + splt 2]
test data = valid data 1[splt 1 + splt 2:]
print(len(train data)) # 30000
print(len(valid data)) # 10000
```

```
print(len(test_data)) # 10000

# test if same number of positive and negative reviews in validation set
total_1 = 0
total_2 = 0
for i in valid_data:
    if int(i[0]) > 5 or int(i[0]) == 0:
        total_1 += 1
    else:
        total_2 += 1
print (total_1)
print (total_2)
```

### Input process

```
vocab lst = sorted(list(vocab))
# move padding char '' (empty string) to index 0
vocab lst.remove("")
vocab lst.insert(0, "")
print(len(vocab lst), vocab lst)
# A mapping of index => word (string)
vocab itos = dict(enumerate(vocab lst))
# A mapping of word => its index
vocab stoi = {word:index for index, word in vocab_itos.items()}
def convert_words_to_indices(sents):
    indices = []
    for i in range(len(sents)):
      ind = []
      for word in sents[i]:
        ind.append(vocab stoi[word] if word in vocab lst else vocab stoi[""])
      indices.append(ind)
    return indices
def get batch(data, range min, range max):
    Convert one batch of data in the form of sentence into input and output
    data and return the training data (xs, ts) where:
     - `xs` is an numpy array of indices [batch size, max word]
     - `ts` is a numpy array of shape [batch size] containing indicies
    Preconditions:
     - `data` is a numpy array of shape [N, 2]
     - range max > range min
   xs, ts = [], []
```

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```
for d in data[range_min:range_max]:
    ts.append(int(d[0]))
    xs.append(d[1])

xs = convert_words_to_indices(xs)

xs = np.array(xs)

ts = np.array(ts)
```

## Part 3 Build model and train

```
## model
class LSTMmodel(nn.Module):
    def init (self, vocab size = vocab size, emb size = 100, num hidden = 150):
        super(LSTMmodel, self). init ()
        self.embedding = nn.Embedding(vocab size, emb size)
        self.conv1 = nn.Conv1d(in channels=emb size, out channels=32, kernel size=3
        self.pool = nn.MaxPool1d(kernel size=2)
        self.lstm = nn.LSTM(50, num hidden, batch first=True)
        self.dropout = nn.Dropout(p=0.2)
        self.fc1 = nn.Linear(num hidden, 50)
        self.fc2 = nn.Linear(50, 10)
        self.softmax = nn.Softmax(dim=1)
    def forward(self, x):
        x = x.long() # for embedding type debug
        x = self.embedding(x)
        x = self.dropout(x)
        x = self.pool(torch.relu(self.conv1(x)))
        x = self.lstm(x)[0]
        x = x[:, -1, :]
        x = self.fcl(x)
        x = self.fc2(x)
        x = self.softmax(x)
        return x
```

#### **Train function**

```
weight decay=weight decay)
iters, losses = [], []
iters sub, train accs, val accs = [], [], []
n = 0 # the number of iterations
while True:
    for i in range(0, train data.shape[0], batch size):
       if (i + batch size) > train data.shape[0]:
           break
       # get the input and targets of a minibatch
       xs, ts = get batch(train data, i, i + batch size)
       # convert from numpy arrays to PyTorch tensors
       xs = torch.Tensor(xs)
       ts = torch.Tensor(ts).long()
       zs = model(xs)
       loss = criterion(zs, ts) # compute the total loss
       optimizer.zero_grad() # a clean up step for PyTorch
       # save the current training information
       iters.append(n)
       losses.append(float(loss)/batch size) # compute *average* loss
       if n % 200 == 0: # was 500
           iters sub.append(n)
           train cost = float(loss.detach().numpy())
           train acc = get accuracy(model, train data)
           train accs.append(train_acc)
           val acc = get accuracy(model, valid data)
           val accs.append(val acc)
           print("Iter %d. [Val Acc %.0f%%] [Train Acc %.0f%%, Loss %f]" % (
                 n, val acc * 100, train acc * 100, train cost))
           if (checkpoint path is not None) and n > 0:
               torch.save(model.state dict(), checkpoint path.format(n))
       # increment the iteration number
       n += 1
       if n > max iters:
           return iters, losses, iters_sub, train_accs, val_accs
```

### Accuracy

```
def get accuracy(model, data, batch size=32, max N=100):
    Estimate the accuracy of the model on the data. To reduce
    computation time, use at most `max N` elements of `data` to
    produce the estimate.
    correct = 0
    correct 1 = 0
    N = 0
    for i in range(0, data.shape[0], batch size):
        # get a batch of data
        xs, ts = get batch(data, i, i + batch size)
        # forward pass prediction
        z = model(torch.Tensor(xs))
        z = z.detach().numpy() # convert the PyTorch tensor => numpy array
        pred = np.argmax(z, axis=1)
        correct += np.sum(pred == ts)
        for i in range(1, 5):
            for j in range(1, 5):
                pred cur = pred[pred == i]
                ts cur = ts[pred == i]
                pred cur = pred cur[ts cur == j]
                correct 1 += pred cur.shape[0]
        for j in range(6, 10):
            for i in range(6, 10):
                pred cur = pred[pred == i]
                ts cur = ts[pred == i]
                pred cur = pred cur[ts cur == j]
                correct 1 += pred cur.shape[0]
                pred cur = pred[pred == i]
                ts cur = ts[pred == i]
                pred cur = pred cur[ts cur == 0]
                correct 1 += pred cur.shape[0]
            pred cur = pred[pred == 0]
            ts cur = ts[pred == 0]
            pred_cur = pred_cur[ts_cur == j]
            correct 1 += pred cur.shape[0]
        N += ts.shape[0]
        if N > \max N:
            break
    acc 1 = correct / N
    acc 2 = correct 1 / N
```

return acc 2

```
def get accuracy 1(model, data, batch size=32, max N=100):
    Estimate the accuracy of the model on the data. To reduce
    computation time, use at most `max N` elements of `data` to
    produce the estimate.
    correct = 0
    correct 1 = 0
    N = 0
    pred list = []
    for i in range(0, data.shape[0], batch size):
        # get a batch of data
        xs, ts = get batch(data, i, i + batch size)
        # forward pass prediction
        z = model(torch.Tensor(xs))
        z = z.detach().numpy() # convert the PyTorch tensor => numpy array
        pred = np.argmax(z, axis=1)
        pred list.append(pred)
    return np.array(pred list)
def plot learning curve(iters, losses, iters sub, train accs, val accs):
    11 11 11
    Plot the learning curve.
    plt.title("Learning Curve: Loss per Iteration")
    plt.plot(iters, losses, label="Train")
    plt.xlabel("Iterations")
    plt.ylabel("Loss")
    plt.show()
    plt.title("Learning Curve: Accuracy per Iteration")
    plt.plot(iters_sub, train_accs, label="Train")
    plt.plot(iters sub, val accs, label="Validation")
    plt.xlabel("Iterations")
    plt.ylabel("Accuracy")
    plt.legend(loc='best')
    plt.show()
```

### Naive-bayes model

```
def read sentences naive(path, max word):
    data = []
    punct = string.punctuation
    stopWords = stopwords.words("english")
    stemmer = PorterStemmer()
    for line in open(path):
        # replace <br/> and punctuations
        line 1 = line.replace("<br />", "")
        # remove punctuations
        for i in line 1:
            if i in punct:
                line 1 = line 1.replace(i, " ")
        words 1 = line 1.split()
        # remove stop words
        words = [word for word in words 1 if len(word) > 4 and word not in stopWord
        for i in range(len(words)):
            words[i] = stemmer.stem(words[i])
        for word in words:
            for l in range(len(word) - 2):
                if word[l] == word[l + 1] == word[l + 2]:
                    words.remove(word)
                    break
        for word in words:
            for l in word:
                if l.isdigit():
                    words.remove(word)
                    break
        sentence = [int(words 1[0]), [word.lower() for word in words[0 : max word]]
        data.append(sentence)
    return data
# read sentences and vocab
\max \text{ word} = 150
train data naive = np.array(read sentences naive(train path, max word))
valid naive = np.array(read sentences naive(valid path, max word))
vocab = set([w for s in train data naive for w in s[1]])
vocab size = len(vocab)
print(vocab size)
# split valid data set into valid set and test set
splt = len(valid naive) // 2
test data naive = valid naive[splt :]
valid data naive = valid naive[: splt]
nrint(len(train data naive)) # 25000
```

```
print(len(valid data naive)) # 12500
print(train data[0])
# Build the input of Naive-bayes model
train sen = train data naive[:,1].tolist()
# print(train sen[100])
t = train data naive[:,0]
t list = t.tolist()
print(t list)
t1 = np.zeros([len(t_list), 10])
for i in range(len(t_list)):
    t1[i][t list[i]] = 1
print(t1)
print(len(train sen))
# Build naive-bayes model
def make matrix(data, vocab):
    num = 0
    true vocab = {}
    for i in range(len(vocab)):
        true vocab[vocab[i]] = i
    X = np.zeros([len(data), len(vocab)])
    for i in range(len(data)):
        list vocab = data[i]
        for j in list vocab:
            if j in vocab:
                X[i][true\_vocab[j]] = 1
        num += 1
        print(num)
    return X
def naive bayes map(X, t, t1):
    N, vocab_size = X.shape[0], X.shape[1]
    t1 sum = t1.sum(0)
    pi = (t1_sum + 2 - 1) / (N + 2 + 2 - 2)
    theta = np.zeros([vocab size, 10])
    X 1 = X[t == 1]
    X 2 = X[t == 2]
    X 3 = X[t == 3]
    X 4 = X[t == 4]
    X 5 = X[t == 5]
```

```
V \circ = V \Gamma = 0
    X 7 = X[t == 7]
    X 8 = X[t == 8]
   X 9 = X[t == 9]
    X 10 = X[t == 0]
    N 1 = X 1.shape[0]
    X 1 = (X 1.sum(axis = 0) + 1) / (N 1 + 2)
    theta[:,0] = theta[:,0] + X 1
    N 2 = X 2.shape[0]
    X 2 = (X 2.sum(axis = 0) + 1) / (N 2 + 2)
    theta[:,1] = theta[:,1] + X 2
    N 3 = X 3.shape[0]
    X_3 = (X_3.sum(axis = 0) + 1) / (N_3 + 2)
    theta[:,2] = theta[:,2] + X 3
    N 4 = X 4.shape[0]
    X 4 = (X 4.sum(axis = 0) + 1) / (N 4 + 2)
    theta[:,3] = theta[:,3] + X 4
    N 5 = X 5.shape[0]
    X 5 = (X 5.sum(axis = 0) + 1) / (N 5 + 2)
    theta[:,4] = theta[:,4] + X 5
   N 6 = X 6.shape[0]
    X 6 = (X 6.sum(axis = 0) + 1) / (N 6 + 2)
    theta[:,5] = theta[:,5] + X 6
    N 7 = X 7.shape[0]
    X 7 = (X 7.sum(axis = 0) + 1) / (N 7 + 2)
    theta[:,6] = theta[:,6] + X 7
    N 8 = X 8.shape[0]
    X 8 = (X 8.sum(axis = 0) + 1) / (N 8 + 2)
    theta[:,7] = theta[:,7] + X 8
    N 9 = X 9.shape[0]
    X 9 = (X 9.sum(axis = 0) + 1) / (N_9 + 2)
    theta[:,8] = theta[:,8] + X 9
    N 10 = X 10.shape[0]
   X 10 = (X 10.sum(axis = 0) + 1) / (N 10 + 2)
    theta[:,9] = theta[:,9] + X 10
    return pi, theta
def training 3(data, t, t1, vocab):
    X = make matrix(data, vocab)
```

```
pi, theta = naive bayes map(X, t, t1)
    return [pi, theta, vocab]
# Create prediction function
def make prediction 3(review, vocab, pi, theta):
    punctuation = string.punctuation
    for punc in punctuation:
        review = review.replace(punc, "")
    X = np.zeros([1, len(vocab)])
    words = review.split()
    for j, w in enumerate(vocab):
        if w in words:
            X[0, j] = 1
    V, K = theta.shape
    X 	ext{ opposite} = np.ones([1, V]) - X
    theta opposite = np.ones([V, K]) - theta
    cur largest pro = 0
    cur large k = 0
    for k in range(K):
        exist = X * theta[:,k]
        not exist = X opposite * theta opposite[:,k]
        All = exist + not_exist
        cur p = np.log(All)
        cur p = cur p.sum(1)
        cur_p = np.exp(cur_p)
        cur_p = cur_p * pi[k]
        if cur p > cur largest pro:
            cur largest pro = cur p
            cur large k = k
    return cur large k + 1
# get accuracy
def get accuracy naive(data set, vocab, pi, theta):
    accurate = 0
    acc = 0
    for i in data set:
        sentence = i[1]
        cur_sen = ""
        for word in sentence:
            cur sen += word + " "
        pred = make prediction 3(cur sen, vocab, pi, theta)
        if pred == i[0]:
            accurate += 1
        if 0 < pred < 6 and 0 < i[0] < 6:
            acc += 1
```

```
if 5 < pred < 11 and 5 < i[0] < 11:
            acc += 1
    return acc / len(data set)
def total training model(x, t, t1):
    model total = []
    #training mode 1 -- RNN model
   model 1 = []
    lstm model = LSTMmodel()
    learning curve info = train(lstm model, max iters=400)
    model 1.append(lstm model)
    #training mode 2 -- Naive Bayes model
    model 3 = training 3(train sen, t, t1, list(vocab))
    model total.append(model 1)
    model total.append(model 3)
    return model total
def total predict 1(x, test, test data, vocab, model total):
    cur sen = ""
    for word in test:
        cur sen += word + " "
    y2 = make prediction 3(cur sen, list(vocab), model total[1][0], model total[1]|
    return y2
def total predict 2(x, test data, vocab, model total):
    y1 = get accuracy 1(model total[0][0], test data)
    return y1
model total = total training model(train data, t, t1)
```

### Part 4 Results

```
result list = []
target_list = []
num_here = -1
for i in test data:
    num here += 1
    result = total predict 1(train data, i[1], valid data, vocab, model total)
    target = i[0]
    result list.append(result)
    target list.append(target)
    print ("number:", num here, "result:", result, "target:", target)
result 1 = np.array(result list)
target_1 = np.array(target_list)
print (test data[1])
result 2 = total predict 2(train data, valid data, vocab, model total)
print(result 2)
result 3 = np.array([])
for i in result 2:
    result 3 = np.concatenate((result 3, i), axis = 0)
print(result 3.shape)
print(target 1.shape)
    (12500,)
    (12500,)
result input = np.vstack((result 1, result 3))
result input = result input.transpose()
print(result input.shape)
    (12500, 2)
from sklearn.linear model import LinearRegression
lr = LinearRegression(fit intercept=False).fit(result input, target 1)
print(lr.coef )
    [0.76630422 1.5897359 ]
def final total predict 1(x, test, test data, vocab, model total):
    cur sen = ""
    for word in test:
```

```
cur sen += word + " "
    y2 = make prediction 3(cur sen, list(vocab), model total[1][0], model total[1]|
    return y2
def final total predict 2(x, test data, vocab, model total):
    y1 = get accuracy 1(model total[0][0], test data)
    return y1
final 2 = final total predict 2(train data, test data, vocab, model total)
final 3 = np.array([])
for i in final 2:
    final 3 = np.concatenate((final 3, i), axis = 0)
print(final 3.shape)
print(final 3)
    (12500,)
    [0. 0. 1. \ldots 0. 1. 0.]
    <ipython-input-78-8b51ec17a987>:23: VisibleDeprecationWarning: Creating an nda
       return np.array(pred list)
correct = 0
total = len(test data)
for i in range(len(test_data)):
    result = total predict 1(train data, test data[i][1], test data, vocab, model t
    target = test data[i][0]
    if int(target) == 0:
        target = 10
    else:
        target = int(target)
    result = int(result)
    result = (lr.coef_[1] * result + lr.coef_[0] * final_3[i]) / 2
    result = int(result)
    if int(target) < 5 and int(result) < 5:</pre>
        correct += 1
```

```
.....
    if int(target) > 5 and int(result) > 5:
        correct += 1
    if i % 100 == 0 and i != 0:
        print(correct/i)
    print ("number:", i, "result:", result, "target:", target)
print(correct/total)
    Streaming output truncated to the last 5000 lines.
    number: 7550 result: 1 target: 1
    number: 7551 result: 8 target: 9
    number: 7552 result: 6 target: 8
    number: 7553 result: 8 target: 10
    number: 7554 result: 1 target: 1
    number: 7555 result: 0 target: 1
    number: 7556 result: 1 target: 1
    number: 7557 result: 8 target: 9
    number: 7558 result: 3 target: 3
    number: 7559 result: 1 target: 9
    number: 7560 result: 0 target: 9
    number: 7561 result: 1 target: 3
    number: 7562 result: 8 target: 10
    number: 7563 result: 8 target: 8
    number: 7564 result: 7 target: 10
    number: 7565 result: 7 target: 10
    number: 7566 result: 1 target: 4
    number: 7567 result: 8 target: 10
    number: 7568 result: 1 target: 4
    number: 7569 result: 1 target: 2
    number: 7570 result: 1 target: 1
    number: 7571 result: 2 target: 3
    number: 7572 result: 1 target: 1
    number: 7573 result: 1 target: 4
    number: 7574 result: 1 target: 1
    number: 7575 result: 0 target: 10
    number: 7576 result: 1 target: 1
    number: 7577 result: 3 target: 4
    number: 7578 result: 1 target: 4
    number: 7579 result: 6 target: 7
    number: 7580 result: 3 target: 4
    number: 7581 result: 1 target: 4
    number: 7582 result: 7 target: 7
    number: 7583 result: 1 target: 2
    number: 7584 result: 0 target: 4
    number: 7585 result: 6 target: 8
    number: 7586 result: 8 target: 8
    number: 7587 result: 2 target: 4
    number: 7588 result: 0 target: 10
    number: 7589 result: 8 target: 9
    number: 7590 result: 6 target: 3
```

number: 7591 result: 7 target: 3 number: 7592 result: 6 target: 10 number: 7593 result: 1 target: 2 number: 7594 result: 7 target: 1 number: 7595 result: 1 target: 7 number: 7596 result: 1 target: 7 number: 7597 result: 7 target: 7 number: 7598 result: 0 target: 8 number: 7599 result: 8 target: 4 0.8243421052631579 number: 7600 result: 6 target: 8 number: 7601 result: 8 target: 8 number: 7602 result: 8 target: 8 number: 7603 result: 8 target: 7 number: 7604 result: 0 target: 4 number: 7605 result: 1 target: 1

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